

Associations with monetary values do not influence access to awareness for faces

Marcus Rothkirch^{Corresp., 1}, Maximilian Wieser¹, Philipp Sterzer^{1, 2}

¹ Department of Psychiatry and Psychotherapy, Charité – Universitätsmedizin Berlin, corporate member of Freie Universität Berlin, Humboldt-Universität zu Berlin, and Berlin Institute of Health, Berlin, Germany

² Bernstein Center for Computational Neuroscience, Humboldt Universität Berlin, Berlin, Germany

Corresponding Author: Marcus Rothkirch
Email address: marcus.rothkirch@charite.de

Human faces can convey socially relevant information in various ways. Since the early detection of such information is crucial in social contexts, socially meaningful information might also have privileged access to awareness. This is indeed suggested by previous research using faces with emotional expressions. However, the social relevance of emotional faces is confounded with their physical stimulus characteristics. Here, we sought to overcome this problem by manipulating the relevance of face stimuli through classical conditioning: Participants had to learn the association between different face exemplars and high or low amounts of positive and negative monetary outcomes. Before and after the conditioning procedure, the time these faces needed to enter awareness was probed using continuous flash suppression, a variant of binocular rivalry. While participants successfully learned the association between the face stimuli and the respective monetary outcomes, faces with a high monetary value did not enter visual awareness faster than faces with a low monetary value after conditioning, neither for rewarding nor for aversive outcomes. Our results tentatively suggest that behaviorally relevant faces do not have privileged access to awareness when the assessment of the faces' relevance is dependent on the processing of face identity, as this requires complex stimulus processing that is likely limited at pre-conscious stages.

Associations with monetary values do not influence access to awareness for faces

Marcus Rothkirch¹, Maximilian Wieser¹, Philipp Sterzer^{1,2}

¹ Department of Psychiatry and Psychotherapy, Charité – Universitätsmedizin Berlin, corporate member of Freie Universität Berlin, Humboldt-Universität zu Berlin, and Berlin Institute of Health, Berlin, Germany

² Bernstein Center for Computational Neuroscience, Humboldt-Universität zu Berlin, Berlin, Germany

Corresponding Author:

Marcus Rothkirch

Charitéplatz 1, Berlin, 10117, Germany

Email address: marcus.rothkirch@charite.de

Abstract

Human faces can convey socially relevant information in various ways. Since the early detection of such information is crucial in social contexts, socially meaningful information might also have privileged access to awareness. This is indeed suggested by previous research using faces with emotional expressions. However, the social relevance of emotional faces is confounded with their physical stimulus characteristics. Here, we sought to overcome this problem by manipulating the relevance of face stimuli through classical conditioning: Participants had to learn the association between different face exemplars and high or low amounts of positive and negative monetary outcomes. Before and after the conditioning procedure, the time these faces needed to enter awareness was probed using continuous flash suppression, a variant of binocular rivalry. While participants successfully learned the association between the face stimuli and the respective monetary outcomes, faces with a high monetary value did not enter visual awareness faster than faces with a low monetary value after conditioning, neither for rewarding nor for aversive outcomes. Our results tentatively suggest that behaviorally relevant faces do not have privileged access to awareness when the assessment of the faces' relevance is dependent on the processing of face identity, as this requires complex stimulus processing that is likely limited at pre-conscious stages.

Introduction

The ability to identify and to rapidly read information from human faces has a pivotal role in social contexts. Since the multitude of information conveyed by faces goes far beyond the image per se, different cognitive systems are involved in face processing. Faces are thus a popular tool to assess what types of information can be processed without the observer's awareness or have preferential access to awareness (Axelrod, Bar & Rees, 2015; Madipakkam & Rothkirch, 2019). A particular focus of previous research in this context was on the question whether the social meaning of faces is already processed at pre-conscious stages, thereby facilitating conscious awareness of faces that convey socially relevant information. Indeed, facial cues signaling threat (Yang, Zald & Blake, 2007; Yang & Yeh, 2018), trustworthiness (Stewart et al., 2012; Getov et al., 2015), or positive emotions (Stein & Sterzer, 2012) seem to accelerate the awareness of faces. However, emotional expressions and other social characteristics of faces, such as trustworthiness or dominance, are inextricably linked to physical stimulus properties, like contrast, luminance, or spatial frequencies. In fact, the prioritization of emotional faces can be largely explained by differences in such physical stimulus properties (Stein & Sterzer, 2012; Gray et al., 2013; Hedger et al., 2016; Stein et al., 2018). To be able to unequivocally attribute differences in the access to awareness of faces to their behavioral relevance, however, the influence of physical stimulus properties should be ruled out first (Moors et al., 2019).

An elegant way to circumvent the inherent confound between physical stimulus properties and higher-level relevance is to ascribe behavioral relevance to faces in a systematic and controlled manner. That way, the association between the physical characteristics and the relevance of stimuli can be balanced out across observers. Anderson et al. (2011) followed such an approach by pairing faces with positive, negative, or neutral gossip. They observed that faces previously paired with negative gossip dominated visual awareness during a following binocular rivalry task. In subsequent studies, in contrast, affective biographical information did not influence observers' awareness of faces, suggesting a rather limited impact of such information on visual awareness (Rabovsky, Stein & Abdel Rahman, 2016; Stein et al., 2017). One reason for these conflicting findings might be that the relevance of social information depends on each individual's evaluation of this information. Indeed, the time for complex stimuli to reach awareness can depend on the subjectively experienced value of the stimulus (Schmack et al., 2016) or certain personality traits of the observer (Madipakkam et al., 2019).

In the present study, we chose to systematically pair images of faces with high or low amounts of monetary reward and punishment. Manipulating the behavioral relevance of faces by means of monetary incentives has several advantages over using verbal descriptions. In comparison to the latter, monetary values are quantitative, which implies that different conditions can be clearly defined. In this regard, different conditions are set by different amounts of the same unit, whereas for biographical information descriptions of positive behaviors or traits, for example, are

compared to entirely different descriptions that are supposed to be identified as neutral. Thus, monetary values allow for a systematic control of the behavioral relevance of faces and are intersubjectively meaningful. In our study, participants had to learn the association between face stimuli and monetary values. Before and after the learning phase, the same faces were presented under breaking continuous flash suppression (bCFS), a variant of binocular rivalry, to measure the time they require to get access to awareness. We hypothesized that if learned values facilitate faces' access to awareness, there should be a stronger decrease in response times after the conditioning session for faces associated with a high monetary compared to a low monetary value. The inclusion of monetary reward as well as punishment further enabled us to detect valence-specific effects of learned values on visual awareness.

Materials & Methods

Participants

Twenty-four participants (13 females; age: 18 – 35 years, $M = 24.54 \pm 0.8$ standard error of the mean [SEM]) took part in the experiment. This sample size allowed us to completely counterbalance the association between the stimulus exemplars and the monetary values across participants. Five participants were left-handed, all other participants were right-handed. All participants had normal or corrected-to-normal vision and written informed consent was obtained from each participant prior to their participation in the experiment. The study was approved by the local ethics committee of the Charité – Universitätsmedizin Berlin (EA1/301/13) and performed in accordance with the Declaration of Helsinki.

Stimuli and Apparatus

The face stimuli used in the study were grey-scale photographs of four different female faces with a neutral expression, taken from the NimStim Set of Facial Expressions (Tottenham et al., 2009; image IDs: 01, 07, 09, 17). All four images were similar in global contrast (root mean square contrast between 0.16 and 0.20) and luminance (mean luminance between 27.49 cd/m² and 31.35 cd/m²). All stimuli were presented on a uniformly grey background (30.28 cd/m²). Participants viewed the screen through a mirror stereoscope providing separate visual input to the two eyes. Each participant's head was stabilized by a chin rest at a viewing distance of 60 cm. All stimuli were presented using MATLAB (The MathWorks, Natick, MA, USA) and Psychtoolbox-3 (<http://psychtoolbox.org/>) on a 19 inch CRT monitor (resolution: 1024 x 768 Px, refresh rate: 60 Hz).

Procedure

The experiment consisted of three phases: 1) a pre-conditioning phase to measure baseline response times, 2) a conditioning phase during which different faces were paired with monetary

outcomes, and 3) a post-conditioning phase that was identical to the pre-conditioning phase, intended to assess the change in response times after the conditioning had taken place.

In the initial pre-conditioning phase (Figure 1A), different face exemplars were presented under continuous flash suppression. At the beginning of each trial, a black rectangle ($10^\circ \times 10^\circ$) and a black fixation cross in its center ($0.68^\circ \times 0.68^\circ$) were presented to each eye. The rectangle and the cross were visible throughout the whole experimental phase. After a fixation duration of 2 s, high-contrast dynamic mask stimuli consisting of circles and squares of various colors and sizes were flashed to a randomly selected eye at a frequency of 10 Hz. Simultaneously, a face image ($3.75^\circ \times 3.75^\circ$) that was located within one of the four quadrants of the black rectangle was presented to the other eye. The contrast of the face stimulus linearly increased from 0% to 100% during the initial 2 s. After that, the face remained at full contrast until the end of the trial. A trial ended when the participant gave a manual response or, if no response was made, after 15 s. Participants' task was indicate the location of the face, that is, the quadrant in which the face appeared, as fast and as accurately as possible by pressing one of four designated keys on the keyboard. This part of the experiment comprised 96 trials. The combination of the face exemplar, the location of the face, and the eye to which the face was presented was counterbalanced and randomized across trials.

In the second phase, participants had to learn the association between the face exemplars and monetary outcomes by means of classical conditioning (Figure 1B). In each trial, one of the faces that were already presented in the first part of the experiment was shown in the center of the screen. Below the face, a positive or negative monetary value was displayed. The face and the value were presented for 5 s. After the offset of the face and the associated monetary value, a blank screen was presented for a randomized interval between 1 s and 1.6 s before the next trial started. Each face was associated with one of four different monetary values: -2 €, -0.1 €, +0.1 €, and +2 €. In 75% of the trials, the face was depicted with its associated monetary value. In the remaining trials, an outcome of 0 € was presented along with the face. Participants were instructed to passively view the stimuli and to memorize the association between the faces and the monetary values as well as possible. They were further informed that they would receive or lose the amount of money depicted in each trial. This phase of the experiment comprised four blocks, during which each face was presented four times. The order of the face exemplars was randomized and the association between the face exemplars and the monetary values was fully counterbalanced across participants. The association was further kept constant across all four blocks.

To assess whether participants were indeed able to learn these associations, query trials were added at the end of each block. Each face was presented once during these query trials. In contrast to the conditioning trials, a question mark and all four different monetary values were displayed below the face in random order. Participants were required to select the value that was associated with the respective face by pressing one of four designated buttons. The face and the monetary values were presented until a response was made. Participants were informed that their overall payoff would depend on the accuracy of their choices during these query trials. This

means that for the correct assignment of a monetary reward to the respective face, the monetary value (+2 € or +0.1 €) was added to their payoff. For negative monetary values, a correct assignment avoided a reduction of the payoff, while for incorrect assignments the payoff was reduced by the respective amount of money (-2 € or -0.1 €).

The post-conditioning phase, which followed directly after the conditioning phase, was fully identical to the pre-conditioning phase. After the experiment, participants rated how much they felt motivated by the different monetary values to memorize the faces on a visual analog scale ranging from 0 to 5.

Data Analysis

Participants' learning performance during the conditioning phase was assessed on the basis of their responses in the query trials. For each of the four blocks, each participant's accuracy in assigning the monetary value to each face exemplar was computed. The chance level for each block was .25.

For the bCFS phase before and after the conditioning phase, trials in which participants responded incorrectly or failed to give a response until the end of a trial were discarded from further analysis (percentage of trials: $M = 3.80\%$, $SD = 3.48\%$). Furthermore, response times below 200 ms were considered anticipatory responses and were also discarded from further analysis (percentage of trials: $M = 0.61\%$, $SD = 1.26\%$). To compare the response times between the different conditions, we followed two approaches. For the first approach, we computed the median response time for each participant and condition before and after conditioning. We then subtracted the median response times of the pre-conditioning phase from the median response times of the post-conditioning phase, which resulted in a measure for the change of response times for each condition and participant. Finally, we performed two paired t-tests to compare the change in response times between high and low reward as well as between high and low punishment. The alpha level of these two t-tests was adjusted to .025 to account for multiple comparisons. For the second approach, we analyzed the response time distributions in more depth by computing hierarchical shift functions (Rousset & Wilcox, 2019), which can be more sensitive to response time differences, especially when they are restricted to early or late responses. To this end, we computed the deciles of the response time distribution for each condition and participant before and after conditioning. In a next step, we subtracted the deciles of the pre-conditioning phase from the deciles of the post-conditioning phase. The resulting values thus indicate the change in response times for each segment of the whole distribution, where lower deciles reflect faster responses and higher deciles slower responses. For each decile, we then performed a paired t-test to compare the changes in response times of the high reward to the low reward condition and of the high punishment to the low punishment condition. As this amounts to 18 different t-tests in total, we adjusted the alpha level of the t-tests to .003.

To probe potential time-dependent effects of learned values, we additionally split the post-conditioning phase into two halves. For statistical inference, we performed repeated-measures ANOVAs with the factors time (first half vs. second half of the post-conditioning phase) and

value (high value vs. low value). Separate ANOVAs were performed for reward-related and punishment-related stimuli. The focus of this analysis was on the interaction between time and value, since a statistically significant interaction would signify an influence of the monetary value that was dependent on time. In addition to frequentist inference statistics, we computed Bayes Factors (BF10) for each t-test, using a default Cauchy prior of 0.707. For ANOVAs we computed BF10 directly from the F-values of the ANOVA statistics (Faulkenberry, 2018). In line with previous suggestions (Wetzels & Wagenmakers, 2012), we interpret $BF10 > 3$ as evidence for the alternative hypothesis and $BF10 < 1/3$ as evidence for the null hypothesis.

Results

Classical conditioning

At the end of every block in the conditioning phase, participants had to indicate the associated monetary value for each presented face. Figure 2 depicts the accuracy of these responses for the four different blocks. Since participants had to make four choices in each block, the chance level corresponds to an accuracy of .25 for each block. Binomial tests indicated that the response accuracies across all four blocks exceeded chance level for all participants ($p \leq .002$, $BF10 \geq 10.10$). Thus, participants quickly and successfully learned the associations between the face exemplars and the monetary outcomes. After the experiment, participants rated their motivation for each monetary value on a visual analog scale ranging from 0 to 5. In comparison to a low reward of 0.1 € ($M = 1.51 \pm 0.28$ SEM), participants felt substantially more motivated by the high reward of 2 € ($M = 2.98 \pm 0.36$ SEM; paired t-test: $t(23) = 4.99$, $p < .001$, $BF10 = 521.53$). The difference in motivation between a low punishment of 0.1 € ($M = 1.46 \pm 0.30$ SEM) and a high punishment of 2 € ($M = 2.08 \pm 0.37$ SEM) was less pronounced compared to reward ($t(23) = 2.42$, $p = .024$, $BF10 = 2.35$), but still statistically significant at a corrected threshold of $\alpha = .025$.

Response times during breaking-CFS

Figure 3A shows the change in response times from the pre-conditioning to the post-conditioning phase for the two different reward conditions. For the high reward condition, response times decreased by 507.05 ms (± 130.67 ms SEM), on average, while for the low reward condition we observed an average decrease in response times of 408.51 ms (± 102.60 ms SEM). The difference between the two conditions was not statistically significant ($t(23) = 0.83$, $p = .42$) and the Bayes factor indicated the absence of an effect ($BF10 = 0.29$). The numerical difference between the two reward conditions was strongly driven by one outlier, who showed a much larger response time decrease for the high reward compared to the low reward stimulus in contrast to all other participants (leftmost data point in Figure 3A). After removal of this data point, the average change in response times for the high reward condition ($M = -402.70$ ms \pm

82.15 ms SEM) was much more similar to the low reward condition ($M = -400.35 \text{ ms} \pm 106.82 \text{ ms SEM}$). The paired t-test was again clearly indicative of an absence of a difference between the two conditions ($t(22) = 0.03$, $p = .97$, $BF10 = 0.22$).

The average change in response times for the high and low punishment condition are depicted in Figure 3B. Numerically, there was a stronger decrease in response times for the low punishment condition ($M = -485.68 \pm 142.55 \text{ ms SEM}$) in comparison to the high punishment condition ($M = -394.27 \pm 113.91 \text{ ms SEM}$). However, the difference between the two conditions was again not statistically significant and indicative of an absence of an effect ($t(23) = 0.78$, $p = .44$, $BF10 = 0.28$).

Differences between high and low values, however, might be limited to a specific range of the whole response time distributions, that is, the learned values could specifically affect fast or slow responses, which would not necessarily be captured by measures of central tendencies. We therefore explored the response time distributions in more depth by computing the change between the pre- and the post-conditioning phase for each decile of the whole response time distribution for each condition. For reward-related stimuli (Figure 4A) as well as for punishment-related stimuli (Figure 4B), the decrease in response times was more pronounced for slower responses. However, there was no significant difference between high and low values for any of the deciles ($p \geq .23$ and $BF10 \leq 0.42$ for reward, $p \geq .07$ and $BF10 \leq 1.03$ for punishment). Of note, the difference between high and low punishment was close to an uncorrected significance level of .05 for the last decile. The response time decrease in this decile, however, was numerically stronger for low punishment compared to high punishment and as such contrary to our a priori hypothesis.

Due to extinction, potential influences of the monetary associations on response times could have quickly decayed during the post-conditioning phase. Thus, averaging across all responses in the post-conditioning phase might have masked the effects of learned values. To identify potential time-dependent effects, we split the post-conditioning phase into two halves. We performed two repeated-measures ANOVAs with the factors time (first half vs. second half of the post-conditioning phase) and value (low value vs. high value). If the influence of learned values was indeed dependent on time such that it quickly faded after the conditioning block, this should be reflected in the interaction between time and value. However, neither for faces previously associated with reward ($F(1,23) = 0.63$, $p = .43$, $BF10 = 0.28$) nor for faces associated with punishment ($F(1,23) = 0.88$, $p = .36$, $BF10 = 0.32$) we observed an interaction between time and value.

Discussion

We studied whether learned values, established by means of classical conditioning with

monetary reward and punishment, influence access to awareness for faces. While participants successfully learned the association between the different face exemplars and the monetary values, the learned association did not have an influence on their response times. Response times generally decreased from the pre- to the post-conditioning phase. However, this decrease was equally strong for high compared to low reward and for high compared to low punishment. A more in-depth exploration of the response time distributions did not reveal an advantage for faces paired with a higher compared to a lower monetary value either.

Faces can express and convey their relevance in various ways, for instance through their emotional expression or particular facial features such as eye gaze. In the current study, we paired faces with monetary incentives to render them behaviorally relevant. This way, we intended to circumvent a confound between physical stimulus characteristics and higher-level social relevance, which is especially prevalent in the investigation of the awareness of emotional faces (Hedger et al., 2016). While it has previously been suggested that learned associations between affective information and faces affect the faces' potency to dominate awareness (Anderson et al., 2011), subsequent studies did not observe a privileged access to awareness for faces paired with affective information (Rabovsky, Stein & Abdel Rahman, 2016; Stein et al., 2017). Our findings are in line with the latter studies, while at the same time complementing these previous results by showing that not only biographical information but also monetary incentives fail to facilitate awareness of faces. The approach of associating face stimuli with affective information, however, differs in two aspects from the investigation of the influence of emotional expressions. First, emotional expressions are inherent to a face, while the association with affective information has to be learned. Secondly, the identification of emotional expressions often only requires the processing of certain facial features. A rapid detection of fearful faces, for instance, is likely due to the greater exposure to the iris and the sclera in fearful faces (Whalen et al., 2004). Effects of learned associations, in contrast, likely requires the identification of the faces' whole identity. Since conditioned responses to fear-conditioned faces transfer to novel images of the same face identity (Rehbein et al., 2018), learned associations are indeed, at least partly, related to the face's identity. Thus, the influence of learned affective information, as in our case by means of monetary values, is dependent on a more complex analysis of the stimulus at pre-conscious stages. As the processing of face identity is rather limited under visual masking (Moradi, Koch & Shimojo, 2005; Amihai, Deouell & Bentin, 2011), the scope of pre-conscious face processing might not be sufficient to boost faces into awareness that have been coupled with positive or negative outcomes.

Participants were clearly able to learn the association between the face exemplars and the respective monetary values. The absence of an influence of the associated values on the access of the faces to awareness can thus not be attributed to a failure or difficulties of participants to learn these associations. There is ample evidence for sustained neural (Rothkirch et al., 2012) and behavioral effects (Raymond & O'Brien, 2009; Rutherford, O'Brien & Raymond, 2010;

Rothkirch et al., 2013) of previously learned associations between faces and monetary values, indicating that pairing face stimuli with monetary outcomes has the potency to render face stimuli behaviorally relevant for an extended period of time. It must be noted, however, that such associations have been mostly induced by means of instrumental conditioning so far. While classical conditioning with monetary incentives can generally bring about similar effects compared to instrumental conditioning (Delgado, Labouliere & Phelps, 2006; Bucker & Theeuwes, 2016, 2017), the specific combination of face stimuli and monetary outcomes in the context of classical conditioning has only rarely been studied so far (but see: Trilla Gros, Panasiti & Chakrabarti, 2015). It has further been demonstrated previously that simple visual stimuli, like gratings, can gain faster access to awareness by means of classical fear conditioning (Gayet et al., 2016), showing that a conditioning approach can, in principle, confer behavioral relevance to visual stimuli such that they access awareness more rapidly. There is the residual possibility that the association between the face stimuli and the monetary values in our study did not effectively change the affective content of the faces, especially because associating faces with monetary incentives by means of classical conditioning might be less effective compared to instrumental conditioning. For fear-conditioning, the effectiveness of the conditioning procedure is usually assessed on the basis of physiological measures, like skin conductance responses. For appetitive conditioning and conditioning with monetary outcomes, in contrast, such a standard physiological measure has not yet been established. Since pupil size promises to be a fruitful measure of the effectiveness of appetitive conditioning (Pietrock et al., 2019), it could be assessed in future studies focusing on the influence of learned stimulus values on the access to awareness. The availability of such a measure would also allow to relate the strength of conditioning in each individual to the effect of learned values on visual awareness (Madipakkam et al., 2016; Vieira et al., 2017).

It is conceivable that an influence of learned values on response times might have quickly decayed after the conditioning phase, for instance due to extinction. Furthermore, it has previously been reported that responses to fear-conditioned faces rapidly decrease when these faces are visually masked (Raio et al., 2012). Thus, effects of learned values can be obscured when responses are aggregated across the post-conditioning phase. However, an analysis that distinguished between the first and second half of the post-conditioning phase did not provide any indication of such time-dependent effects in our study. Moreover, while Raio et al. (2012) conducted the conditioning procedure with faces that were suppressed from awareness, which likely established only unstable associations between the conditioned and unconditioned stimuli, the conditioning procedure in our study was performed with fully visible face stimuli.

While we used faces with a neutral expression in our study, a potential approach to further strengthen the association between the faces and the monetary values is to use faces with an emotional expression. As suggested by the ‘preparedness hypothesis’, faces with different emotional expressions might be differentially prepared to become associated with different

outcomes (Dimberg & Öhman, 1996). In this context, pairing aversive outcomes with angry faces, for instance, might be more effective than pairing them with neutral faces. The specific interactions between different emotional expressions and monetary outcomes have not been systematically studied yet, however, and such an approach may come at the expense of potential ceiling effects (Lonsdorf et al., 2017). Finally, while we have used monetary outcomes to render face stimuli behaviorally relevant, the use of other reinforcers, like liquid rewards in water-deprived participants or bursts of white noise, are conceivable alternatives. We chose monetary outcomes as they are easy to administer and can be equally employed as rewarding and aversive stimuli. Furthermore, the processing of primary and secondary reinforcers, including monetary values, shows large overlaps in the human brain (Izuma, Saito & Sadato, 2008; Delgado, Jou & Phelps, 2011; Sescousse et al., 2013), which suggests that monetary values can evoke similar positive or negative experiences in comparison to other types of reinforcers.

Conclusions

To conclude, we did not observe a privileged access to awareness for faces that were associated with positive or negative monetary outcomes, although participants quickly learned these associations. This tentatively suggests that learned values that are tied to a face's identity have only limited influence on the face's access to awareness, as such an influence possibly exceeds the scope of pre-conscious processing.

References

- Amihai I, Deouell L, Bentin S. 2011. Conscious Awareness is Necessary for Processing Race and Gender Information from Faces. *Consciousness and cognition* 20:269–279. DOI: 10.1016/j.concog.2010.08.004.
- Anderson E, Siegel EH, Bliss-Moreau E, Barrett LF. 2011. The visual impact of gossip. *Science* (New York, N.Y.) 332:1446–1448. DOI: 10.1126/science.1201574.
- Axelrod V, Bar M, Rees G. 2015. Exploring the unconscious using faces. *Trends in Cognitive Sciences* 19:35–45. DOI: 10.1016/j.tics.2014.11.003.
- Bucker B, Theeuwes J. 2016. Appetitive and aversive outcome associations modulate exogenous cueing. *Attention, Perception, & Psychophysics* 78:2253–2265. DOI: 10.3758/s13414-016-1107-6.

- Bucker B, Theeuwes J. 2017. Pavlovian reward learning underlies value driven attentional capture. *Attention, Perception, & Psychophysics* 79:415–428. DOI: 10.3758/s13414-016-1241-1.
- Delgado MR, Jou RL, Phelps EA. 2011. Neural Systems Underlying Aversive Conditioning in Humans with Primary and Secondary Reinforcers. *Frontiers in Neuroscience* 5. DOI: 10.3389/fnins.2011.00071.
- Delgado MR, Labouliere CD, Phelps EA. 2006. Fear of losing money? Aversive conditioning with secondary reinforcers. *Social Cognitive and Affective Neuroscience* 1:250–259. DOI: 10.1093/scan/nsl025.
- Dimberg U, Öhman A. 1996. Behold the wrath: Psychophysiological responses to facial stimuli. *Motivation and Emotion* 20:149–182. DOI: 10.1007/BF02253869.
- Faulkenberry TJ. 2018. Computing Bayes factors to measure evidence from experiments: An extension of the BIC approximation. *Biometrical Letters* 55:31–43. DOI: 10.2478/bile-2018-0003.
- Gayet S, Paffen CLE, Belopolsky AV, Theeuwes J, Van der Stigchel S. 2016. Visual input signaling threat gains preferential access to awareness in a breaking continuous flash suppression paradigm. *Cognition* 149:77–83. DOI: 10.1016/j.cognition.2016.01.009.
- Getov S, Kanai R, Bahrami B, Rees G. 2015. Human brain structure predicts individual differences in preconscious evaluation of facial dominance and trustworthiness. *Social Cognitive and Affective Neuroscience* 10:690–699. DOI: 10.1093/scan/nsu103.
- Gray KLH, Adams WJ, Hedger N, Newton KE, Garner M. 2013. Faces and awareness: low-level, not emotional factors determine perceptual dominance. *Emotion (Washington, D.C.)* 13:537–544. DOI: 10.1037/a0031403.
- Hedger N, Gray KLH, Garner M, Adams WJ. 2016. Are visual threats prioritized without awareness? A critical review and meta-analysis involving 3 behavioral paradigms and 2696 observers. *Psychological Bulletin* 142:934–968. DOI: 10.1037/bul0000054.
- Izuma K, Saito DN, Sadato N. 2008. Processing of Social and Monetary Rewards in the Human Striatum. *Neuron* 58:284–294. DOI: 10.1016/j.neuron.2008.03.020.
- Lonsdorf TB, Menz MM, Andreatta M, Fullana MA, Golkar A, Haaker J, Heitland I, Hermann A, Kuhn M, Kruse O, Meir Drexler S, Meulders A, Nees F, Pittig A, Richter J, Römer S, Shiban Y, Schmitz A, Straube B, Vervliet B, Wendt J, Baas JMP, Merz CJ. 2017. Don't fear 'fear

conditioning': Methodological considerations for the design and analysis of studies on human fear acquisition, extinction, and return of fear. *Neuroscience & Biobehavioral Reviews* 77:247–285. DOI: 10.1016/j.neubiorev.2017.02.026.

Madipakkam AR, Rothkirch M. 2019. The Unconscious Processing of Social Information. In: *Transitions Between Consciousness and Unconsciousness*. Routledge, 92–117. DOI: 10.4324/9780429469688-4.

Madipakkam AR, Rothkirch M, Dziobek I, Sterzer P. 2019. Access to awareness of direct gaze is related to autistic traits. *Psychological Medicine* 49:980–986. DOI: 10.1017/S0033291718001630.

Madipakkam AR, Rothkirch M, Wilbertz G, Sterzer P. 2016. Probing the influence of unconscious fear-conditioned visual stimuli on eye movements. *Consciousness and Cognition* 46:60–70. DOI: 10.1016/j.concog.2016.09.016.

Moors P, Gayet S, Hedger N, Stein T, Sterzer P, van Ee R, Wagemans J, Hesselmann G. 2019. Three Criteria for Evaluating High-Level Processing in Continuous Flash Suppression. *Trends in Cognitive Sciences* 23:267–269. DOI: 10.1016/j.tics.2019.01.008.

Moradi F, Koch C, Shimojo S. 2005. Face Adaptation Depends on Seeing the Face. *Neuron* 45:169–175. DOI: 10.1016/j.neuron.2004.12.018.

Pietroock C, Ebrahimi C, Katthagen TM, Koch SP, Heinz A, Rothkirch M, Schlagenhauf F. 2019. Pupil dilation as an implicit measure of appetitive Pavlovian learning. *Psychophysiology* 56:e13463. DOI: 10.1111/psyp.13463.

Rabovsky M, Stein T, Abdel Rahman R. 2016. Access to Awareness for Faces during Continuous Flash Suppression Is Not Modulated by Affective Knowledge. *PloS One* 11:e0150931. DOI: 10.1371/journal.pone.0150931.

Raio CM, Carmel D, Carrasco M, Phelps EA. 2012. Nonconscious fear is quickly acquired but swiftly forgotten. *Current Biology* 22:R477–R479. DOI: 10.1016/j.cub.2012.04.023.

Raymond JE, O'Brien JL. 2009. Selective visual attention and motivation: the consequences of value learning in an attentional blink task. *Psychological Science* 20:981–988. DOI: 10.1111/j.1467-9280.2009.02391.x.

- Rehbein MA, Pastor MC, Moltó J, Poy R, López-Penadés R, Junghöfer M. 2018. Identity and expression processing during classical conditioning with faces. *Psychophysiology* 55:e13203. DOI: 10.1111/psyp.13203.
- Rothkirch M, Ostendorf F, Sax A-L, Sterzer P. 2013. The influence of motivational salience on saccade latencies. *Experimental Brain Research* 224:35–47. DOI: 10.1007/s00221-012-3284-4.
- Rothkirch M, Schmack K, Schlagenhaut F, Sterzer P. 2012. Implicit motivational value and salience are processed in distinct areas of orbitofrontal cortex. *NeuroImage* 62:1717–1725. DOI: 10.1016/j.neuroimage.2012.06.016.
- Rousselet GA, Wilcox RR. 2019. Reaction times and other skewed distributions: problems with the mean and the median. *PsyArXiv*. DOI: 10.31234/osf.io/3y54r.
- Rutherford HJV, O’Brien JL, Raymond JE. 2010. Value associations of irrelevant stimuli modify rapid visual orienting. *Psychonomic Bulletin & Review* 17:536–542. DOI: 10.3758/PBR.17.4.536.
- Schmack K, Burk J, Haynes J-D, Sterzer P. 2016. Predicting Subjective Affective Salience from Cortical Responses to Invisible Object Stimuli. *Cerebral Cortex* (New York, N.Y.: 1991) 26:3453–3460. DOI: 10.1093/cercor/bhv174.
- Sescousse G, Caldú X, Segura B, Dreher J-C. 2013. Processing of primary and secondary rewards: A quantitative meta-analysis and review of human functional neuroimaging studies. *Neuroscience & Biobehavioral Reviews* 37:681–696. DOI: 10.1016/j.neubiorev.2013.02.002.
- Stein T, Awad D, Gayet S, Peelen MV. 2018. Unconscious processing of facial dominance: The role of low-level factors in access to awareness. *Journal of Experimental Psychology. General* 147:e1–e13. DOI: 10.1037/xge0000521.
- Stein T, Grubb C, Bertrand M, Suh SM, Verosky SC. 2017. No impact of affective person knowledge on visual awareness: Evidence from binocular rivalry and continuous flash suppression. *Emotion* (Washington, D.C.) 17:1199–1207. DOI: 10.1037/emo0000305.
- Stein T, Sterzer P. 2012. Not just another face in the crowd: detecting emotional schematic faces during continuous flash suppression. *Emotion* (Washington, D.C.) 12:988–996. DOI: 10.1037/a0026944.

- Stewart LH, Ajina S, Getov S, Bahrami B, Todorov A, Rees G. 2012. Unconscious evaluation of faces on social dimensions. *Journal of Experimental Psychology. General* 141:715–727. DOI: 10.1037/a0027950.
- Tottenham N, Tanaka JW, Leon AC, McCarry T, Nurse M, Hare TA, Marcus DJ, Westerlund A, Casey BJ, Nelson C. 2009. The NimStim set of facial expressions: judgments from untrained research participants. *Psychiatry Research* 168:242–249. DOI: 10.1016/j.psychres.2008.05.006.
- Trilla Gros I, Panasiti MS, Chakrabarti B. 2015. The plasticity of the mirror system: How reward learning modulates cortical motor simulation of others. *Neuropsychologia* 70:255–262. DOI: 10.1016/j.neuropsychologia.2015.02.033.
- Vieira JB, Wen S, Oliver LD, Mitchell DGV. 2017. Enhanced conscious processing and blindsight-like detection of fear-conditioned stimuli under continuous flash suppression. *Experimental Brain Research* 235:3333–3344. DOI: 10.1007/s00221-017-5064-7.
- Wetzels R, Wagenmakers E-J. 2012. A default Bayesian hypothesis test for correlations and partial correlations. *Psychonomic Bulletin & Review* 19:1057–1064. DOI: 10.3758/s13423-012-0295-x.
- Whalen PJ, Kagan J, Cook RG, Davis FC, Kim H, Polis S, McLaren DG, Somerville LH, McLean AA, Maxwell JS, Johnstone T. 2004. Human Amygdala Responsivity to Masked Fearful Eye Whites. *Science* 306:2061–2061. DOI: 10.1126/science.1103617.
- Yang Y-H, Yeh S-L. 2018. Can emotional content be extracted under interocular suppression? *PloS One* 13:e0206799. DOI: 10.1371/journal.pone.0206799.
- Yang E, Zald DH, Blake R. 2007. Fearful expressions gain preferential access to awareness during continuous flash suppression. *Emotion (Washington, D.C.)* 7:882–886. DOI: 10.1037/1528-3542.7.4.882.

Figure 1

Schematic depiction of the experimental procedure.

(A) In the pre- and post-conditioning phase, high-contrast dynamic mask stimuli were presented to one eye at a frequency of 10 Hz. A face stimulus was simultaneously presented to the other eye. The contrast of the face stimulus linearly increased during the initial 2 s and remained at full contrast until the end of the trial. Participants' task was to indicate the location of the face. A trial ended either after a manual response or at the latest after 15 s.

(B) In the conditioning phase, different face stimuli were presented together with their associated monetary outcome (upper part in panel B). Participants' task was to passively view and memorize these associations. This phase comprised four blocks. At the end of each block, query trials were performed (lower part in panel B), where each face stimulus was presented with four different response options. Here, participants had to select the value that was previously associated with the face.

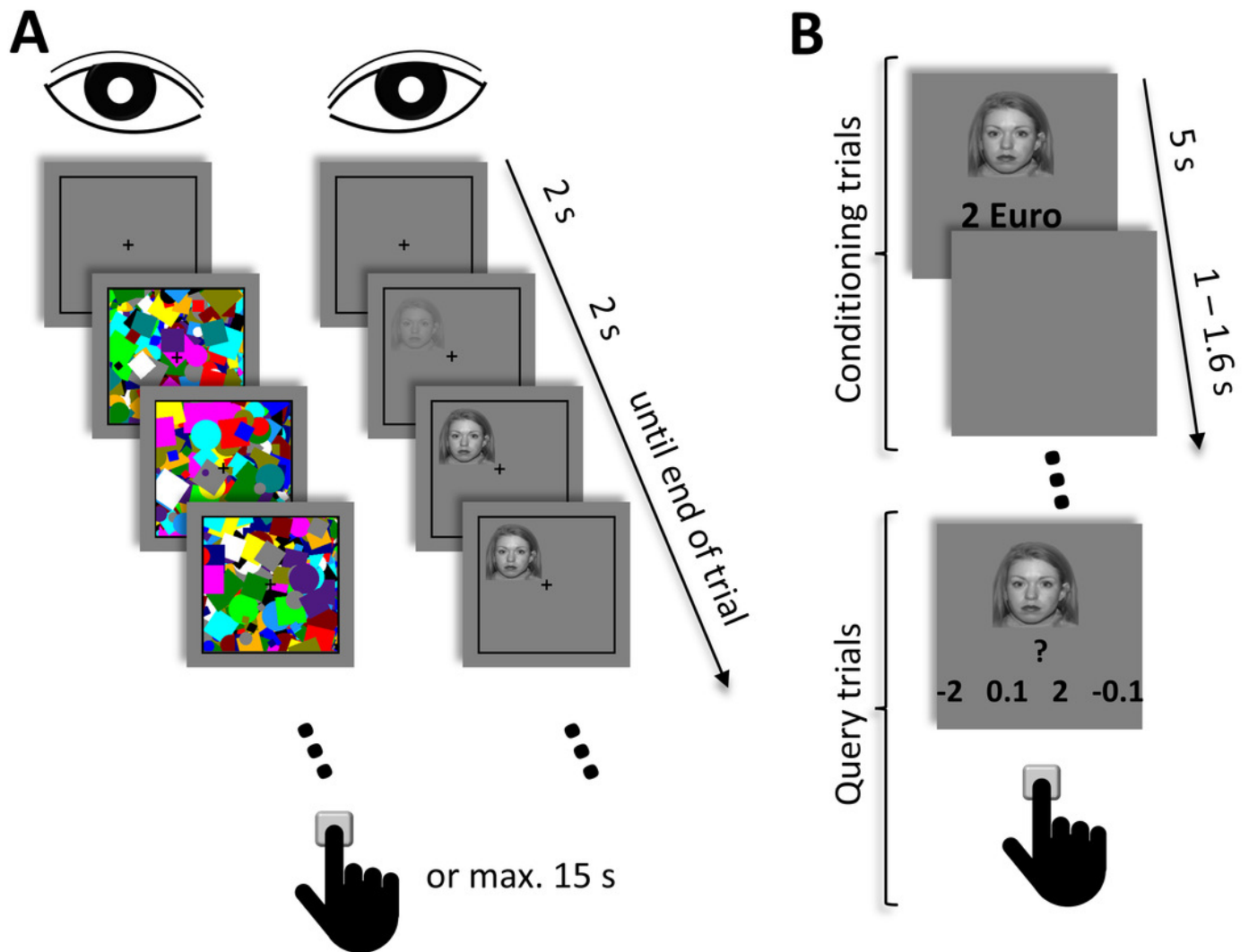


Figure 2

Choice accuracy in the query trials for the four different blocks during the conditioning phase.

Each data point represents one participant.

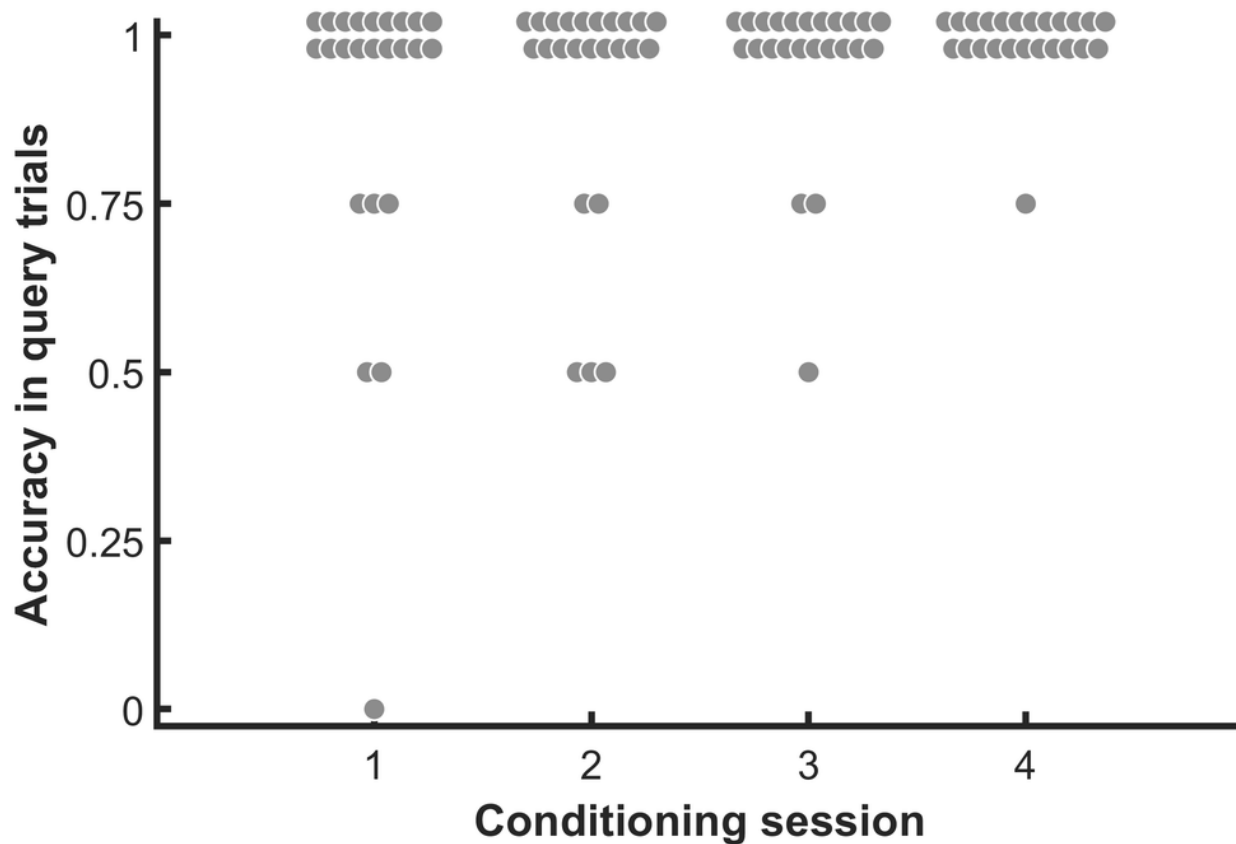


Figure 3

Change in response times from the pre- to the post-conditioning phase for high and low values.

(A) Reward-related stimuli. **(B)** Punishment-related stimuli. The dashed lines represent the mean for each condition across participants. All data points in the grey-shaded area show differences between the two conditions that are consistent with the hypotheses (i.e. stronger decrease for high reward and punishment compared to low reward and punishment, respectively).

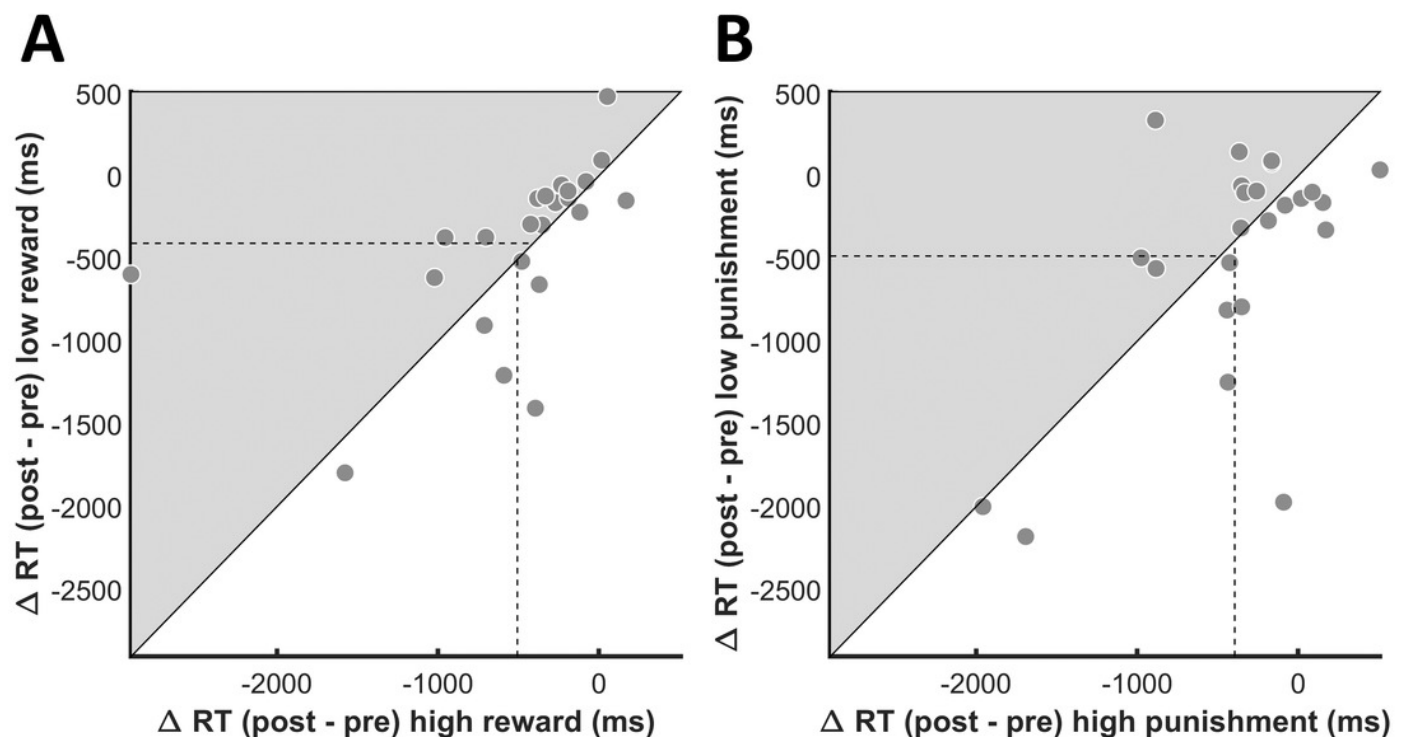


Figure 4

Change in response times for each decile of the whole response distributions.

(A) Reward-related stimuli. **(B)** Punishment-related stimuli. The numbers at the top of each graph indicate the p-values and the Bayes Factors for the comparison between the two conditions for each respective decile. The error bars display standard errors of the mean.

